```
[student559 10@bigdataanalytics-worker-3 bin]$ ./kafka-topics.sh --list --zookeeper bigdataanalytics-worker-3:2181
  .898 1
  MTG
    consumer offsets
 aircraft 20
 alchin les
 alchin les2
 alex test
 cherneev-test
 cherneev test
 covid desc
 covid info sink
 daryaGre
 daryaGre les2
 daryaGre sink
[student559 10@bigdataanalytics-worker-3 bin]$ /usr/hdp/current/kafka-broker/bin/kafka-topics.sh --create --topic lesson 5 iris --zookeeper bigdataanalytics-worker-3:2181 --partition
 2 --config retention.ms=-1
 MARNING: Due to limitations in metric names, topics with a period ('.') or underscore (' ') could collide. To avoid issues it is best to use either, but not both.
Created topic "lesson 5 iris".
[student559_10@bigdataanalytics-worker-3 bin]$
ort MohaYterm hu cuherribing to the professional adition here: https://mohayterm.mohatek.pet
student559 10@bigdataanalytics-worker-3 bin]$ /usr/hdp/current/kafka-broker/bin/kafka-console-producer.sh --topic lesson 5 iris --broker-list bigdataanalytics-worker-3:6667 < /home/student559 10/for stream
 iris.json
 rt MobaXterm by subscribing to the professional edition here: https://mobaxterm.mobatek.net
[student559_10@bigdataanalytics-worker-3 bin]$ /usr/hdp/current/kafka-broker/bin/kafka-console-producer.sh --topic lesson_5_iris --broker-list bigdataanalytics-worker-3:6667 < /home/student559_10/for_stream
 >>>>>>>>>>>>>>>>>>>>>>>>>>>>>>5
ginning --max-messages 10in/kafka-console-consumer.sh --bootstrap-server bigdataanalytics-worker-3:6667 --from-beginning --topic test iris sink --from-be
 uspalLength":5.1, setosalWidth":3.5, "petalLength":1.4, "petalWidth":0.2, "species": "setosa", "offset":1}
  "sepalLength":4.6, "sepalWidth":3.1, "petalLength":1.5, "petalWidth":0.2, "species":"setosa", "offset":4
  "sepalLength":4.6, "sepalWidth":3.4, "petalLength":1.4, "petalWidth":0.3, "species": "setosa", "offset":7}
 "sepalLength":4.9, "sepalWidth":3.1, "petalLength":1.5, "petalWidth":0.1, "species": "setosa", "offset":10}
"sepalLength":4.8, "sepalWidth":3.0, "petalLength":1.4, "petalWidth":0.1, "species": "setosa", "offset":13}
  "sepalLength":5.7, "sepalWidth":4.4, "petalLength":1.5, "petalWidth":0.4, "species": "setosa", "offset":16
  sepalLength":5.7, sepalWidth":3.8, petalLength":1.7, petalWidth":0.3, species": setosa", offset":19"
 "sepalLength":5.1,"sepalWidth":3.7,"petalLength":1.5,"petalWidth":0.4,"species":"setosa","offset":22}
"sepalLength":4.8,"sepalWidth":3.4,"petalLength":1.9,"petalWidth":0.2,"species":"setosa","offset":25}
 Processed a total of 10 messages
  student559 10@bigdataanalytics-worker-3 bin]$
```

```
[student559_10@bigdataanalytics-worker-3 ~]$ export SPARK_KAFKA_VERSION=0.10
[student559_10@bigdataanalytics-worker-3 ~]$ /opt/spark-2.4.8/bin/pyspark --packages org.apache.spark:spark-sql-kafka-0-10_2.11:2.4.5 --driver-memory 512m --master local[1]
Python 2.7.5 (default, Nov 16 2020, 22:23:17)
[GCC 4.8.5 20150623 (Red Hat 4.8.5-44)] on linux2
Type "help", "copyright", "credits" or "license" for more information.
Ivy Default Cache set to: /home/student559 10/.ivy2/cache
The jars for the packages stored in: /home/student559_10/.ivy2/jars
:: loading settings :: url = jar:file:/opt/spark-2.4.8/jars/ivy-2.4.0.jar!/org/apache/ivy/core/settings/ivysettings.xml
org.apache.spark#spark-sql-kafka-0-10 2.11 added as a dependency
:: resolving dependencies :: org.apache.spark#spark-submit-parent-3bff3ec5-9721-4cf8-9565-8108a91abcbf;1.0
        confs: [default]
        found org.apache.spark#spark-sql-kafka-0-10_2.11;2.4.5 in central
        found org.apache.kafka#kafka-clients;2.0.0 in central
        found org.lz4#lz4-java:1.4.0 in central
        found org.xerial.snappy#snappy-java;1.1.7.3 in central
        found org.slf4j#slf4j-api;1.7.16 in central
        found org.spark-project.spark#unused;1.0.0 in central
:: resolution report :: resolve 390ms :: artifacts dl 11ms
        :: modules in use:
        org.apache.kafka#kafka-clients;2.0.0 from central in [default]
        org.apache.spark#spark-sql-kafka-0-10 2.11;2.4.5 from central in [default]
        org.lz4#lz4-java:1.4.0 from central in [default]
        org.slf4j#slf4j-api;1.7.16 from central in [default]
        org.spark-project.spark#unused;1.0.0 from central in [default]
        org.xerial.snappy#snappy-java;1.1.7.3 from central in [default]
        | modules || artifacts |
               conf | number| search|dwnlded|evicted|| number|dwnlded|
              default | 6 | 0 | 0 | 0 || 6 | 0 |
:: retrieving :: org.apache.spark#spark-submit-parent-3bff3ec5-9721-4cf8-9565-8108a91abcbf
        confs: [default]
        0 artifacts copied, 6 already retrieved (0kB/7ms)
22/02/05 10:51:49 WARN util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLevel(newLevel).
22/02/05 10:51:50 WARN util.Utils: Service 'SparkUI' could not bind on port 4040. Attempting port 4041.
Welcome to
Using Python version 2.7.5 (default, Nov 16 2020 22:23:17)
```

```
SparkSession available as 'spark'.
>>> from pyspark.sql import functions as F
>>> from pyspark.sql.types import *
>>> kafka brokers = "bigdataanalytics-worker-3:6667"
>>> raw data = spark.readStream. \
        format("kafka"). \
. . .
        option("kafka.bootstrap.servers", kafka brokers). \
        option("subscribe", "lesson 5 iris"). \
        option("startingOffsets", "earliest"). \
        option("maxOffsetsPerTrigger", "5"). \
        load()
>>> schema = StructType() \
        .add("sepalLength", FloatType()) \
        .add("sepalWidth", FloatType()) \
. . .
        .add("petalLength", FloatType()) \
        .add("petalWidth", FloatType()) \
        .add("species", StringType())
>>>
>>> extended iris = raw data \
        .select(F.from json(F.col("value").cast("String"), schema).alias("value"), "offset") \
        .select("value.*", "offset") \
        .withColumn("receive time", F.current timestamp())
>>> extended iris.printSchema()
root
 |-- sepalLength: float (nullable = true)
  -- sepalWidth: float (nullable = true)
  -- petalLength: float (nullable = true)
  -- petalWidth: float (nullable = true)
  |-- species: string (nullable = true)
  |-- offset: long (nullable = true)
  -- receive time: timestamp (nullable = false)
```

```
>>> stream = console output(extended iris,5)
22/02/05 10:53:32 WARN shortcircuit.DomainSocketFactory: The short-circuit local reads feature cannot be used
Batch: 0
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive time
 4.9
            13.0
                      11.4
                                 10.2
                                            setosa 10
                                                           2022-02-05 10:53:36.826
 null
            Inull
                      Inull
                                 Inull
                                            Inull
                                                           2022-02-05 10:53:36.826
 5.1
            13.5
                      11.4
                                 0.2
                                                          |2022-02-05 10:53:36.826|
                                            |setosa |0
22/02/05 10:53:38 WARN streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger interval
Batch: 1
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive time
15.0
            13.6
                      11.4
                                 10.2
                                                          |2022-02-05 10:53:38.839|
                                            |setosa |1
 4.7
            13.2
                      11.3
                                 10.2
                                            setosa |1
                                                          |2022-02-05 10:53:38.839|
 4.6
            3.1
                                            |setosa |1
                                                          |2022-02-05 10:53:38.839|
Batch: 2
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive time
15.0
                      11.5
                                                           2022-02-05 10:53:40.007
            13.4
                                 10.2
                                            setosa 12
 5.4
            13.9
                      11.7
                                 10.4
                                            setosa |2
                                                           2022-02-05 10:53:40.007
 4.6
            13.4
                      11.4
                                 10.3
                                            |setosa |2
                                                           2022-02-05 10:53:40.007
```

```
[student559 10@bigdataanalytics-worker-3 bin]$ hdfs dfs -ls
Found 5 items
drwx----- - student559 10 student559 10
                                                  0 2022-02-01 06:00 .Trash
drwxr-xr-x - student559 10 student559 10
                                                  0 2022-01-28 23:15 .sparkStaging
drwxr-xr-x - student559 10 student559 10
                                                  0 2022-02-05 10:53 checkpoints
drwxr-xr-x - student559 10 student559 10
                                                  0 2022-01-28 14:11 for stream
                                                  0 2022-01-31 10:04 shadrin iris kafka checkpoint
drwxr-xr-x - student559 10 student559 10
[student559 10@bigdataanalytics-worker-3 bin]$ hdfs dfs -du -h checkpoints/duplicates console chk
       174 checkpoints/duplicates console chk/commits
87
45
             checkpoints/duplicates console chk/metadata
       90
1.3 K 2.6 K checkpoints/duplicates console chk/offsets
             checkpoints/duplicates console chk/sources
41
[student559 10@bigdataanalytics-worker-3 bin]$
```

<pre>>>> deduplicated_iris = waterwarked_iris.drop_duplicates(["species", "receive_time"]) >>> stream = console_output(deduplicated_iris , 20)</pre>							
Batch: 0							
t		hostall anath		, ,		tennium time	
+		petattengtn 	•			receive_time	
null	null		null	null	Θ	2022-02-05 10:55:07.272 2022-02-05 10:55:07.272	
							
Batch: 1							
+	+	+				+	
sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time	
5.0		1.4				2022-02-05 10:55:20.005	
•				,		,	
Batch: 2							
+	+	·		+		+	
sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time	
5.0						2022-02-05 10:55:40.004	
				,		,	
Batch: 3							
+	+	+		+		+	
sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time	
5.4	3.7	1.5	0.2			2022-02-05 10:56:00.005	

```
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
[Stage 14:======> (191 + 1) / 200]22/02/05 10:57:16 |
ot file and delta files if needed...Note that this is normal for the first batch of starting query
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist i
of starting guery.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting query.
22/02/05 10:57:16 WARN state.HDFSBackedStateStoreProvider: The state for version 4 doesn't exist in
of starting guery.
[Stage 14:======>(198 + 1) / 200]22/02/05 10:57:16 |
ot file and delta files if needed...Note that this is normal for the first batch of starting query
.....
Batch: 4
.....
+-----+
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive time
14.8
       13.4
              11.6
                      10.2
                             lsetosa |4
                                       12022-02-05 10:56:48,2661
Batch: 5
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive time
15.4
                             lsetosa 15
       13.9
                      10.4
                                       12022-02-05 10:57:19.4561
------
Batch: 6
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|receive time
10.3
                             lsetosa 16
                                       12022-02-05 10:57:23.2381
 ------
```

```
>>> windowed iris = extended iris.withColumn("window time", F.window(F.col("receive time"), "2 minutes
>>>
>>> windowed iris.printSchema()
root
 |-- sepalLength: float (nullable = true)
  -- sepalWidth: float (nullable = true)
  -- petalLength: float (nullable = true)
  -- petalWidth: float (nullable = true)
  -- species: string (nullable = true)
  -- offset: long (nullable = true)
  -- receive time: timestamp (nullable = false)
  -- window time: struct (nullable = false)
      |-- start: timestamp (nullable = true)
      |-- end: timestamp (nullable = true)
>>> waterwarked windowed iris = windowed iris.withWatermark("window time", "2 minutes")
>>> deduplicated windowed iris = waterwarked windowed iris \
        .drop_duplicates(["species", "window_time"])
>>> stream = console output(deduplicated windowed iris , 5)
```

+	+	+	-+	-++-	+	ceive_tume win	+					
	+	+	-+	-+	+		+					
atch: 1	2											
	+		-+								+	
		dth petalLeng				ceive_time		idow_time				
4.9 	3.6	1.4	0.1 +	setosa 1 -++-		22-02-05 11:00						
2/02/05	11:00:06 WAF	RN streaming.	ProcessingTi	meExecutor:	Current	batch is fall	ing behind.	The trigger	interval	is 5000 millis	seconds,	but spent 602
atch: 1												
		+		-++-	+	+	+					
						ceive_time win						
	+	+	-+	-+	+	+	+					
 atch: 1												
sepalLe	ngth sepalWid	dth petalLeng	h petalWidt	h species o	ffset re	ceive_time win	dow_time					
						+						
atch: 1												
						+ ceive time win						
2/02/05	11:00:23 WAF	RN streaming.	ProcessinaTi	meExecutor:	Current	batch is fall	ing behind.	The trigger	interval	is 5000 millio	seconds.	but spent 804
atch: 1		ser cam eng.		iicexcedeo	out i circ	bacen es race	ang ben and	ine ti tgger	arear vae	13 3000 m ccc c	,,	but spelle oo .
sepalLe	ngth sepalWid	dth petalLeng	h petalWidt	h species o	ffset re		dow_time					
						+						
				meExecutor:	Current	batch is fall	ing behind.	The trigger	interval	is 5000 millis	seconds,	but spent 507
 atch: 1												
	+	+		-+	-+	+	+				+	
	ngth sepalWid	dth petalLeng	h petalWidt	h species	offset	receive_time +	- 1	window_time			- 1	
6.9	3.1	4.9	1.5	versicolo						2022-02-05 11:		

```
>>> sliding_iris = extended_iris.withColumn("sliding_time", F.window(F.col("receive_time"), "1 minute", "30 seconds"))
>>> waterwarked_sliding_iris = sliding_iris.withWatermark("sliding_time", "2 minutes")
>>> deduplicated_sliding_iris = waterwarked_sliding_iris.drop_duplicates(["species", "sliding_time"])
>>> deduplicated_sliding_iris.printSchema()
root
|-- sepalLength: float (nullable = true)
|-- sepalWidth: float (nullable = true)
|-- petalLength: float (nullable = true)
|-- petalWidth: float (nullable = true)
|-- species: string (nullable = true)
|-- offset: long (nullable = true)
|-- receive_time: timestamp (nullable = true)
|-- start: timestamp (nullable = true)
| |-- start: timestamp (nullable = true)
| |-- end: timestamp (nullable = true)
```

>>> stream = console_output(deduplicated_sliding_iris , 20)										
Batch: 0	Batch: 0									
	+	+		+	+	+		+		+
sepalLength						receive_time		sliding_time		1
null 4.9 4.9 null	3.0 3.0	1.4 1.4	0.2 0.2	null setosa setosa null	0 0 0	2022-02-05 12 2022-02-05 12 2022-02-05 12	1:02:36.797 1:02:36.797 1:02:36.797	[2022-02-05 11:02:00, 20 [2022-02-05 11:02:00, 20 [2022-02-05 11:02:30, 20 [2022-02-05 11:02:30, 20	022-02-05 022-02-05 022-02-05	11:03:00] 11:03:30]
Batch: 1										
	++++++++									
+++++++										
Batch: 2										
sepalLength	sepalWidth	petalLength	petalWidth	species	offset	receive_time		sliding_time		Ţ
5.0	3.4	1.5	0.2	setosa	2	2022-02-05 1:	1:03:00.004	[2022-02-05 11:03:00, 20	022-02-05	11:04:00]
++ Batch: 3 + sepalLength sepalWidth petalLength petalWidth species offset receive_time sliding_time ++										
++ stream.stop()										

Batch: 24	
+	· ++
window_time +	count
[2022-02-05 11:04:00, 2022-02-05 11:06:00] +	3
	TimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 28854 milliseconds
Batch: 25	
+	++
window_time +	count
[[2022-02-05 11:04:00, 2022-02-05 11:06:00]	
22/02/05 11:04:46 WARN streaming.Processing	TimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 5589 milliseconds
Batch: 26	
+	++
window_time +	count ++
[[2022-02-05 11:04:00, 2022-02-05 11:06:00]	
22/02/05 11:04:51 WARN streaming.Processing	TimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 5331 milliseconds
Batch: 27	
+	count ++ 12
22/02/05 11:04:57 WARN streaming.Processing	TimeExecutor: Current batch is falling behind. The trigger interval is 5000 milliseconds, but spent 6199 milliseconds

Запустим поток с параметром complete

```
h of starting query.
Batch: 28
Iwindow time
+----+
 [2022-01-31 19:00:00, 2022-01-31 19:02:00]|33
 [2022-01-31 19:06:00, 2022-01-31 19:07:00][9
[2022-02-05 11:04:00, 2022-02-05 11:06:00] 15
[2022-01-31 19:02:30, 2022-01-31 19:03:30]
[[2022-01-31 19:05:30, 2022-01-31 19:06:30]]9
[[2022-01-31 19:06:30, 2022-01-31 19:07:30][3
[[2022-01-31 19:05:00, 2022-01-31 19:06:00][3
[2022-01-31 19:02:00, 2022-01-31 19:04:00][6
[[2022-01-31 19:02:00, 2022-01-31 19:03:00]]3
[2022-01-31 18:58:00, 2022-01-31 19:00:00] 18
22/02/05 11:05:39 WARN streaming.ProcessingTimeExecutor: Current batch
.....
Batch: 29
|window time
+-----
[[2022-01-31 19:00:00, 2022-01-31 19:02:00][33
[2022-01-31 19:06:00, 2022-01-31 19:07:00]
[[2022-02-05 11:04:00, 2022-02-05 11:06:00][18
[2022-01-31 19:02:30, 2022-01-31 19:03:30][3
[[2022-01-31 19:05:30, 2022-01-31 19:06:30][9
 [2022-01-31 19:06:30, 2022-01-31 19:07:30][3
[2022-01-31 19:05:00, 2022-01-31 19:06:00][3
[2022-01-31 19:02:00, 2022-01-31 19:04:00][6
|[2022-01-31 19:02:00, 2022-01-31 19:03:00]|3
|[2022-01-31 18:58:00, 2022-01-31 19:00:00]|18
```

Запустим поток с параметром append (не работает с агрегирующей функцией count) → пропустим Запустим sliding

```
Batch: 43
|sliding time
 [2022-02-05 11:11:30, 2022-02-05 11:12:30]|3
[2022-02-05 11:12:00, 2022-02-05 11:13:00][3
+------+---+---+
Batch: 44
|sliding time
+-----+
 [2022-02-05 11:12:30, 2022-02-05 11:13:30]]3
[2022-02-05 11:13:00, 2022-02-05 11:14:00][3
 . - - - - - - - - - - - + - - - + - - - - + - - - - +
.....
Batch: 45
|sliding time
                                   |count|
[[2022-02-05 11:12:30, 2022-02-05 11:13:30][6
[[2022-02-05 11:13:00, 2022-02-05 11:14:00]]6
```